

SENSITIVITY ANALYSIS OF SMAP-REFLECTOMETRY (SMAP-R) SIGNALS TO VEGETATION WATER CONTENT

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ABSTRACT

Global Navigation Satellite System – Reflectometry (GNSS-R) techniques have proven successful to retrieve several geophysical parameters such as, ocean wind speed, soil moisture, altimetry, wetland dynamics, snow depth estimations. In this paper, the L2C GPS signals measured from the Soil Moisture Active Passive (SMAP) radar after its malfunction is used to investigate the effect of the vegetation water content on the electromagnetic signal. The SMAP-Reflectometry (SMAP-R) measurements are obtained at V and H polarizations allowing for not only signal-to-noise ratio (SNR) analysis but also for polarimetric ratio (PR) studies.

Index Terms— SMAP, reflectometry, GNSS-R, vegetation water content, polarimetry

1. INTRODUCTION

The use of Global Navigation Satellite System – Reflectometry (GNSS-R) techniques in remote sensing has grown exponentially for the past few decades. A number of studies have used these techniques over the ocean to retrieve altimetry and sea state information [1-7], over land to retrieve soil moisture [8-14], and over the ice to retrieve altimetry and ice age [15,16]. With the launch of TechDemosat-1 (TDS-1) [17] and Cyclone Global Navigation Satellite Signals (CYGNSS) [18, 19] the studies have multiplied. Both, TDS-1 and CYGNSS have allowed better ocean wind studies [20-22] and have made possible land surface studies. On one hand, CYGNSS with its increased temporal and spatial resolution, has made possible studies on soil moisture [23] or wetlands dynamics [24-27] from the space. On the other hand, TDS-1, with its polar coverage, has benefited studies of polar sea ice, in terms of altimetry [28], sea ice detection [29], sea ice concentration [30] and sea ice type [31]. The Soil Moisture Active Passive (SMAP) radar instrument malfunction opened the door to a new set of measurements. The radar was switched to 1227.45 MHz to collect GPS L2C signals on August 20, 2015. The characteristics of these measurements differ from the current available from missions like TDS-1 or CYGNSS in terms of polarization (H and V instead of LHCP), high antenna gain (36 dB) and narrow footprint (40 km diameter).

In this work, the SMAP-R measurements are used to study the effect of the vegetation water content on the bistatic radar signals. The selected area under study is the US Midwest between 30 N and 40 N degrees latitude and 105 W and 80 W degrees longitude. The impact of the vegetation water content is analyzed seasonally considering the different land covers and the soil moisture underneath the vegetation canopy. There is a previous study [32] that uses the SMAP-R signal at a broad resolution, spatially averaging the information at 1-degree lat/lon boxes, to assess polarimetric studies of the land and the cryosphere. Section 2 defines the specifics of the SMAP-R measurements, section 3 describes the main parameters affecting the SMAP-R signal over land and section 4 describes the results for the preliminary qualitative analysis. We expect this analysis to be quantitative by the IGARSS 2019 conference timeframe.

2. SMAP-R MEASUREMENT CHARACTERISTICS

The I/Q samples received at the SMAP radar working in receiver mode are publicly available at the Earthdata website (<https://earthdata.nasa.gov>). The data is filtered for those geometries where there is potential to capture a specular point. Those selected I/Q samples are post-processed into delay-Doppler maps (DDM) [33, 34], with a 5 ms coherent time and 25 ms incoherent time (5 incoherent summations). The SMAP antenna points to a fixed 40 degrees incidence angle. The SMAP beamwidth antenna allows to capture reflections at +/- 3 degrees from the central 40 degrees incidence angle. Observations are minimally affected by the variation in the incidence angle, mainly in scenarios where the signal is predominantly coherent. For example, the size of the first Fresnel zone for surfaces with very low roughness as croplands or wetlands, rivers or lakes is something in between [880 m x 1290 m] and [928 m x 1450 m], for 37.5 and 42.5 deg. incidence angle, respectively. For ocean surfaces, the scattering area is hundreds of kilometers and the assumption needs to be revised. SMAP has a high receiver gain: peak antenna gain is 36 dB at 40 deg. and the -3 dB beam width is 2.7 deg. Since antenna is rotating consecutive specular points are ~ 25 km apart. Transmitter gain is assumed to be constant since the geometry is fixed. Transmitted power is unknown, but the impact of its variations is assumed to be under 1.8 dB [35]. The observables derived from the DDMs used in this study are corrected signal-to-noise (SNR) measured at V and

H polarizations and the polarimetric ratio (PR), and are shown in figure 1. The corrected SNR corresponds to the measured SNR corrected for the path losses and the receiver gain.

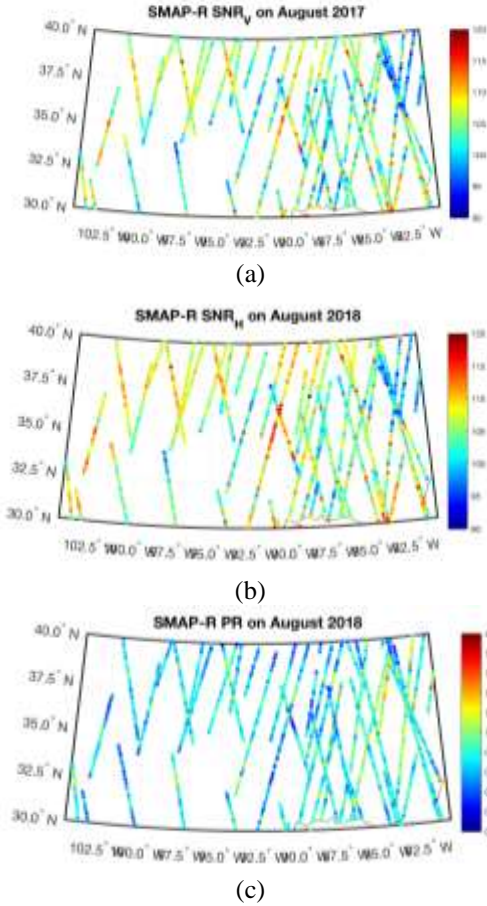


Figure 1. SMAP-R observables, (a) SNR H-pol, (b) SNR V-pol and (c) PR, measured over the US Midwest on August 2018.

3. THE BISTATIC SIGNAL OVER LAND

There are a number of parameters affecting the GPS signals as those go through the vegetation layer, impinge over the soil surface and reflect to the SMAP-R antenna after crossing the vegetation layer on their way up. Those parameters are the vegetation water content, the soil moisture, the soil roughness and the topography. Figure 2 shows the digital elevation model (DEM) map for the area under study.

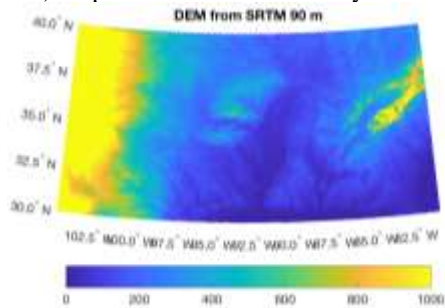


Figure 2. DEM of the area under study, scale in meters.

This map has been obtained from the Shuttle Radar Topography Mission (SRTM) 90 m DEM product. The SMAP-R signals show differences under different topography conditions, but those differences do not vary seasonally. By analyzing changes in a particular area over time, we can assume topography to be invariant. In addition, we should use areas where the topography remains nearly constant. Next, Figure 3 shows the soil moisture (SM) map from the SMAP Level 3 SM product enhanced (SPL3SMP_E, [36]) for the area under study.

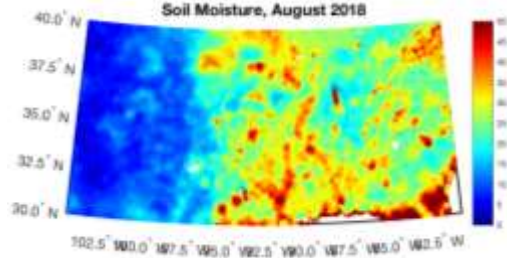


Figure 3. SM map of the area under study, scale in %.

The SMAP-R H and V signals are affected by soil moisture. The more water content in the soil the strongest the reflection. We will start with the SM product derived from SMAP radiometer [36] but other sources may as well be considered. We will take the SM product as an ancillary dataset to analyze areas with similar soil moisture content together helping to distinguish between vegetation effects and soil moisture effects. In other words, we will proceed by filtering by soil moisture levels and then analyzing the impact of vegetation water content (VWC) alone. Particularly it is important to consider this in agricultural areas where soil moisture varies seasonally. Figure 4 shows an example of the VWC maps used as the reference in this study.

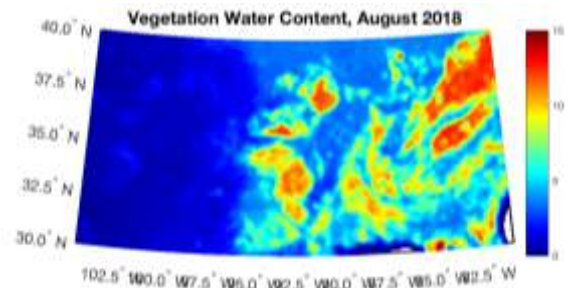


Figure 4. VWC map of the area under study, scale in kg/m^2 .

Those maps are part of the ancillary data [37] from SMAP soil moisture algorithm, [36]. The VWC is provided in the SMAP dataset and follows the method explained in [38]. This method provides a VWC estimation incorporating foliage and stem water content. First, estimates the water content of the foliage based on a Normalized Difference Vegetation Index (NDVI) approach. Then, estimates the stem water content through observations and Leaf Area Index (LAI) modeled by NDVI. Land cover types are considered using the MODIS

(MCD12Q1) International Geosphere-Biosphere Programme (IGBP) classification scheme [38]. The SMAP-R H and V signals are affected by vegetation. The vegetation layer attenuates the SNR signal, the more water content on the vegetation the more attenuation the signal suffers. Also, vegetation water content varies seasonally.

4. QUALITATIVE ANALYSIS OF THE VWC EFFECTS ON THE SMAP-R SIGNAL

In order to understand the impact of the vegetation water content on the SMAP-R signals, we will analyze the effects on the SNR at V pol in two different ways:

- an analysis of VWC differences observed over similar land covers, and
- the possibility of monitoring seasonal variations observed at the same locations.

For the first analysis, we have selected different areas with constant land types obtained from MODIS land cover maps: croplands and deciduous broadleaf forest.

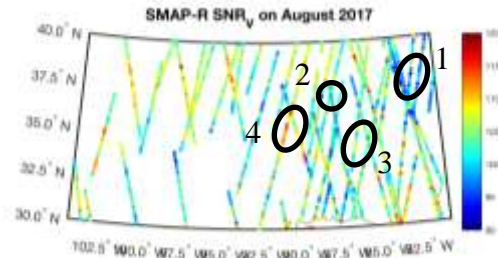


Figure 5. Areas selected in this SNR_V correspond to areas with very different VWC values in figure 4. Scale in dB.

Comparing to the VWC in figure 4, we see that the higher the VWC value the lower the SNR. Summarized in Table 1.

Table 1. Summary of mean VWC values from figure 4 and SNR_V values at the circled areas.

Area	VWC (kg/m ²)	SNR (dB)
1	12	95
2	10	100
3	7.5	105
4	4	112

For the second analysis we have initially focused in a cropland area, marked in figure 6. Important characteristics of this areas are:

- soil moisture, due to irrigation of crops, would be considerably higher in summer than in winter: SM increase implies SNR_V increase.
- VWC is higher in summer when crops are present than winter: VWC increase implies SNR_V decrease.

- there is a river in the circled area: river in the SMAP footprint implies SNR_V increase.

With this being said, the selected area shows a big change in vegetation water content, as it is show in figure 6, between January 2018 and August 2018.

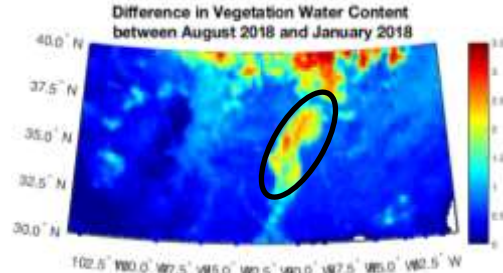


Figure 6. VWC differences observed between January 2018 (winter) and August 2018 (summer).

An increase of 2 kg/m² from January to August 2018 causes ~ a decrease in the SNR_V of 6 dB. So, this would indicate that the attenuation suffered from the increase in vegetation water content is stronger than the increase in SNR caused by the increase in SM. Further and quantitative analysis will be presented at the conference, showing the impact of the VWC on the SNR at both polarizations and on the PR.

5. CONCLUSIONS

This paper describes the preliminary analysis of the impact of VWC in the GPS signal measured at the SMAP radar in bistatic configuration, SMAP-R. The higher the VWC the lower the SNR. If we can quantify the impact of the VWC under a controlled scenario, i.e. adding layers of information regarding, the roughness, topography, soil moisture and type of land cover, next steps will go in the direction of creating a retrieval algorithm based on the most sensitive GNSS-R observables. Using this information derived from SMAP-R signals will help filling the gaps in other instruments and/or creating an independent source of VWC information.

6. ACKNOWLEDGEMENT

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